Theories, Results, and Databases of Topology in Materials

https://www.topologicalquantumchemistry.com https://www.topologicalquantumchemistry.fr/magnetic/ https://www.topologicalquantumchemistry.com/mltqc/ https://www.cryst.ehu.es/









SIMONS FOUNDATION

Collaborators

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Outline

https://www.topologicalquantumchemistry.com https://www.topologicalquantumchemistry.fr/magnetic/ https://www.topologicalquantumchemistry.com/mltqc/ https://www.cryst.ehu.es/

- Background: Topological Quantum Chemistry
- Theory: Magnetic Topological Quantum Chemistry (MTQC)
- Calculation methods
- Results: Topological phase diagrams and High-Throughput Topology
- Magnetic and NonMagnetic Material Database
- Ideal topological materials and new systems
- Topology from machine learning
- Future Directions

Discovery of topological materials



Topological Quantum Chemistry Machine Learning



Link real space orbitals sitting on lattice sites to electronic bands (without a Hamiltonian)?

Band Representation (BR): set of **bands linked to a localized orbital** (respecting all the crystal symmetries and TRS)

Zak PRB 26 (1982)

Image: 1605.06824 Ma et a



- Within the same SG many ways to arrange atoms
- Each arrangement determines different representations

- Within the same lattice, different orbitals





Each arrangement/orbital determines symmetry representations in the Brillouin zone



ATOMIC LIMIT AND WANNIER AS A FUCNTION OF EBRS

Restricting to the little group at k to find irreps at each k point (subduction) -> all bands connected
EBR is defined by a maximal Wyckoff position and the irreps in real space



By construction, a **band representation has an atomic limit**, and all atomic limits yield a band representation*

Hence if we know the atomic limits, we know the topological states

Soluyanov and Vanderbilt















eik





	Г	Х	Y	Μ
s 1a	+	+	+	+
p 1a	-	-	-	-
s 1b	+	-	+	-
p 1b	-	+	-	+
s 1c	+	+	-	-
p 1c	-	-	+	+
s 1d	+	-	+	-
p 1d	-	+	+	-

odd # in l eigenvalues





	Г	Х	Y	Μ
s 1a	+	+	+	+
p 1a	-	-	-	-
s 1b	+	-	+	-
p 1b	-	+	-	+
s 1c	+	+	-	-
p 1c	-	-	+	+
s 1d	+	-	+	-
p 1d	-	+	+	-

TOPOLOGICAL

Full classification of atomic phases

10398 real-space **atomic limits** of non-magnetic materials (groups)

Bilbao Crystallographic Server → BANDREP

Help

Band representations of the Double Space Groups

Band Representations	Please, enter the sequential number of group as given in the International Tables	
This program calculates the band representations (BR) induced from the irreps of the site-symmetry group of a given Wyckoff position. Alternatively, it gives the set of elementary BRs of a Double Space Group. In both cases, it can be chosen to get the BRs with or without time-reversal symmetry. The program also indicates if the elementary BRs are decomposable or indecomposable. If it is decomposable, the program gives all the possible ways to decompose it.	 Get the elementary BRs without time-reversal symmetry Get the elementary BRs with time-reversal symmetry Get the BRs without time-reversal symmetry from a Wyckoff position Get the BRs with time-reversal symmetry from a Wyckoff position 	Elementary Elementary TR Wyckoff Wyckoff TR

Bilbao Crystallographic Server http://www.cryst.ehu.es

For comments, please mail to administrador.bsc@ehu.eus

http://www.cryst.ehu.es/cryst/bandrep

Nature 547, 298--305 (2017)

SG MWP WM PG Irrep Dim KR Bands Re E $\mathrm{PE} \| \mathrm{SG}$ MWP WM PG Irrep Dim KR Bands Re E PE

 $1 \ 1 \ \Gamma_1 \ 1 \ 1 \ 1$ $1 \quad 1a$ 1 e e $||131 \ 2d$ 28 Γ_2^- 1 e e1 $\Gamma_2 = 1$ 2 22 e e131 2d 21a1 8 Γ_{4}^{+} 1 *e e* $2 \quad 1a$ $2 \Gamma_1^+ 1 1 1$ 1 e e131 2d 2 8 Γ_4^- 1 1 e e 2 2 1a $1 \quad 2 \quad \Gamma_1^- \quad 1 \quad 1 \quad 1$ 1 e e131 2d 8 Γ_3^+ 1 1 e e $1 \ 2 \ \overline{\Gamma}_3 \ 1$ 2 2 21a2 e e131 2d 2 8 Γ_3^- 1 e e $1 \ 2 \ \overline{\Gamma}_2 \ 1 \ 2 \ 2$ 2 e e131 2d 2 8 $\overline{\Gamma}_5 = 2$ $2 \quad 1a$ 1 e e $1 \quad 2 \quad \Gamma_1^+ \quad 1 \quad 1 \quad 1$ $2 \quad 1b$ 131 2d $2 8 \Gamma_6$ 1 e e2 1 e e 1 2 Γ_1^- 1 1 1 2 14 Γ_1 1 1 2 2 1b 1 e e $||131 \ 2e$ 1 e e $2 \overline{\Gamma_2}$ 1b $1 \ 2 \ 2$ 2 e e131 2e 2 14 Γ_4 1 1 2 1 e e

12b(2)	8a(3)	8a(3)	12b(2)
B ↑ G(6)	¹ DzĒ↑G(8)	ĒĒ∱G(8)	¹ DzĒ↑G(12)
Indecomposable	Indecomposable	Decomposable	Decomposable
2 Г ₄ (3)	2 Ē₅(2) ⊕ Ē ₆ Ē ₇ (4)	2	2 Ē₅(2) ⊕ 2 Ē ₆ Ē ₇ (4)
H ₁ (1) ⊕ H ₂ H ₃ (2) ⊕ H ₄ (3)	2 H ₅(2) ⊕ H ₆ H ₇ (4)	2 H ₆ H ₇ (4)	2 H̄₅(2) ⊕ 2 H̄ ₆ H̄ ₇ (4)
$P_1(2) \oplus P_2(2) \oplus P_3(2)$	$\overline{P}_5(1) \oplus \overline{P}_6(1) \oplus 2 \ \overline{P}_7(3)$	2 ₽ ₄ (1) ⊕ 2 ₽ ₇ (3)	$\overline{P}_4(1) \oplus \overline{P}_5(1) \oplus \overline{P}_6(1) \oplus 3 \overline{P}_7(3)$
PA ₁ (2) ⊕ PA ₂ (2) ⊕ PA ₃ (2)	$\overline{PA}_5(1) \oplus \overline{PA}_6(1) \oplus 2 \overline{PA}_7(3)$	2 ₱₳₄(1) ⊕ 2 ₱₳ ₇ (3)	$\overline{PA}_4(1) \oplus \overline{PA}_5(1) \oplus \overline{PA}_6(1) \oplus 3 \overline{PA}_7(3)$
3 N₁(1) ⊕ 3 N₂(1)	4 N ₃ N ₄ (2)	4 N ₃ N₄(2)	6 N ₃ N ₄ (2)



Materials search



Materials search



High Order TI in terms of EBRs: The case of Bi



pEBRs of SG 166 with TRS



computed pEBRs of Bi

	3 doubly	-degenerate valence bands
F	F	$F_3F_4; F_5F_6; F_5F_6$
Γ		$ar{\Gamma}_8;ar{\Gamma}_8;ar{\Gamma}_4ar{\Gamma}_5$
L	$ $ \bar{L}	$_{23}L_4; \ L_5L_6; \ L_5L_6$
T		$\bar{T}_9; \ \bar{T}_8; \ \bar{T}_6 \bar{T}_7$

SUPERTOPOLOGY

Question: How many bands do we need to "change" to get to an atomic limit Answer: All??! Then material is super topological

All bands below Fermi for Bi are topological

Nbr Bands	Subclass	Γ	Т	F	L
2	SEBR	8 (1)	9 (1)	5+6 (1)	3+4 (1)
2	SEBR	9 (1)	8 (1)	3+4 (1)	5+6 (1)
2	SEBR	8 (1)	9 (1)	3+4 (1)	3+4 (1)
2	SEBR	8 (1)	8 (1)	5+6 (1)	5+6 (1)
2	SEBR	4+5 (1)	6+7 (1)	5+6 (1)	5+6 (1)
2	SEBR	9 (1)	8 (1)	3+4 (1)	3+4 (1)
2	SEBR	9 (1)	9 (1)	3+4 (1)	3+4 (1)
2	SEBR	6+7 (1)	4+5 (1)	3+4 (1)	5+6 (1)
2	SEBR	9 (1)	9 (1)	5+6 (1)	3+4 (1)

830 compounds show supertopology

Sneak Preview: New Website, All Materials With < 70 Atoms/Unit cell



Check Topology

www.cryst.ehu.es/cryst/checktopologicalmat

Check Topo Check Topological Mat.	Diogical Mat	<pre>Number of electrons=10 Number of maximal k-vectors=4 Symbols of the k-vectors, number of bands up to fermi level and set of irreps. -GM -X -L -W 10 10 10 10</pre>
Given a file that contain the eigenvalues at each maximal k-vec of a space group, the program gives the set of irreducible representations at each maximal k-vec (time-reversal is assumed). Then, using the compatibility relations and the set of Elementary Band Representations (EBRs), it checks whether the set of bands can be put as linear combinations of EBRs. This (self-explanatory) file shows the format of the file to be uploaded in the menu on the right: File_Description You can download examples of input files here: Example_Ag1Ge1Li2 Example_Ag1O2Sc1 Example_B2Ca3Ni7 Example_Ba3Co10O17 Example_Ba3Ca1O9Ru2 You can generate the "trace.txt" file in your own computer using VASP and this program (fortran). vasp2trace Read the "README.pdf" file for help on the use of vasp2trace. If you are using "Check Topological Mat." and/or "vasp2trace" programs in the preparation of an article, please cite this reference:	Browse No file selected. Show	 The material is a topological insulator. List of topological indices: z2w,1=0 z2w,2=0 z2w,3=0 z4=0 z2=0 z8=4 The material belongs to the strong topological class: 1 Clicking on See the irreps you can see the details about the number of bands and the idei The set of bands can be put as linear combination of Elementary Band Representations (I to get some possible linear combinations of EBRs and partial EBRs. Click on Subgroups to check the topological character of the structure is each of its (trans

1. A number of bands that is **not a sum of EBRs is topological**

2. A number of bands that does not satisfy the compatibility relations cannot be separated from other bands and describes a semimetal

Nature 566, 480-485 (2019)

Magnetic Materials

- Magnetic materials can also be topological
 - Case-by-case evaluation
 - QAH, AFM TI, Magnetic Weyl, "Axion" Insulators (AXIs)
- Significant Computational complications
 - Is mean-field-theory valid? (bands?)
 - Is magnetic order measured (magnetic order prediction is hard)?
 - Is magnetism commensurate?
 - If all the above yes, still very hard!
 - Must compute electronic structrure
 - Must have full theory of magnetic topology: not even full representations are derived

Haldane, *PRL* (1988) Mong, Essin, Moore, *PRB* (2010) Hughes, Prodan, Bernevig, *PRB* (2010) Wan, Turner, Vishwanath, Savrasov, *PRB* (2011)



Is this a topological magnet??

Magnetic Symmetry and Group Theory

Assume: <u>bands exist, magnetic structure is known, commensurate</u>

- Many, many magnetic symmetry groups (1421 MSGs vs. 230 SGs)
- Magnetic order ≠ MSG



- Full magnetic coreps/irreps are inaccessible
- Magnetic compatibility relations aren't known
- Magnetic trivial bands (MEBRs) aren't known
- Magnetic eigenvalue indicators (topological indices) aren't known

Some coreps in Fortran tables: Miller and Love (1967)

PT. R AUGHENTERS 1/2-X,-Y,Z1 X+1/2- R1 2 (+); 4; 2; E R3 2 (-); (-1)4; (+1)E; (-1)3	·Y+1/2	-ZI -X.1/2	•Y•1/2•	Z Rž R4	22	(+) 1 (-) 1	41 21 (+1)41	(-)E (-I)E((-1)3
OPERATORS 4 49 3,3 4,1 25 27,3 28,1 2,2 2,2 2,2 2,2 2,2 2,2 2,2 2	· 2 · 2 · 0 · 0	2 3 2 - 0 -2	2 2 2 -2 0 0 21 -2 0 0	I					
PT- A AUGMENTERS X+1/2-Y+1/2-Z; 1/3 A1 2 (+1; 4; T(-13 A3 1 (-); (+1)£; T(+1)Ĕ A5 1 (-); (-1)Ĕ; T(+1)Ĕ	2+X+1/	2-4+1/2+2		A2 A4	1	(-) 1 (-) 1	(+I)E (-I)E	T(-I)E T(-I)E	
OPERATURS 1 49 75-3 28-1	A 1 2 0 0	2 -1 -1,TI -1,TI -1,TI	3 -1 I 1.TI 1.TI 1.TI	4 -1 -1 -1.TI 1.TI	5 -1 -1 1.TI -1,TI				

MSG indicator groups (not indices) (*e.g.* $\mathbb{Z}_2 \times \mathbb{Z}_2$): Watanabe, Po, Vishwanath, *Sci. Adv.* (2018)

Magnetic Topological Quantum Chemistry

- Complete theory of mean-field magnetic topology
- MTQC subsumes TQC (230 SGs + 1421 MSGs = 1651 SSGs)
 - Calculate all magnetic coreps and all 33021 (M)EBRs



N	Magnetic Coreps and MEBRs Soon <u>Freely Accessible</u> on Bilbao Crystallographic Server								
Wycko	off pos.	1a(2',1)	1a(2',1)	1b(2',1)	1b(2',1)	1c(2',1)	1c(2',1)	1d(2',1)	1d(2',1)
Band	d-rep.	A↑G(1)	Ā ∱G(1)	A∱G(1)	Ā ∱G(1)	A∱G(1)	Ā ∱G(1)	A↑G(1)	Ā ∱G(1)
Decom \Indecom	posable nposable	Indecomposable	Indecomposable	Indecomposable	Indecomposable	Indecomposable	Indecomposable	Indecomposable	Indecomposable
Г:(0,0,0)	Г:(0,0,0)	Г ₁ (1)	Ē₂(1)	Г ₁ (1)	Γ ₂ (1)	Г ₁ (1)	Ē₂(1)	Г ₁ (1)	Γ ₂ (1)
A:(1/2,0,1/2)	U:(1/2,0,1/2)	(A)U ₁ (1)	(A)Ū ₂ (1)	(A)U ₁ (1)	(A)U ₂ (1)	(A)U ₁ (1)	(A)Ū ₂ (1)	(A)U ₁ (1)	(A)Ū ₂ (1)
B:(0,0,1/2)	Z:(0,0,1/2)	(B)Z ₁ (1)	(B) <mark>Z</mark> ₂(1)	(B)Z ₁ (1)	(B)2 ₂ (1)	(B)Z ₁ (1)	(B) <mark>Z</mark> ₂(1)	(B)Z ₁ (1)	(B) Z ₂(1)
C:(1/2,1/2,0)	V:(1/2,1/2,0)	(C)V ₁ (1)	(C)∇ ₂ (1)	(C)V ₁ (1)	(C)∇ ₂ (1)	(C)V ₁ (1)	(C)∇ ₂ (1)	(C)V ₁ (1)	(C)∇ ₂ (1)
D:(0,1/2,1/2)	T:(0,1/2,1/2)	(D)T ₁ (1)	(D)T ₂ (1)	(D)T ₁ (1)	(D)T ₂ (1)	(D)T ₁ (1)	(D)T ₂ (1)	(D)T ₁ (1)	(D)T ₂ (1)
E:(1/2,1/2,1/2)	R:(1/2,1/2,1/2)	(E)R ₁ (1)	(E)R ₂ (1)	(E)R ₁ (1)	(E)R ₂ (1)	(E)R ₁ (1)	(E)R ₂ (1)	(E)R ₁ (1)	(E)R ₂ (1)
Y:(1/2,0,0)	X:(1/2,0,0)	(Y)X ₁ (1)	(Y)X ₂ (1)	(Y)X ₁ (1)	(Y)X ₂ (1)	(Y)X ₁ (1)	(Y)X ₂ (1)	(Y)X ₁ (1)	(Y)X ₂ (1)
Z:(0,1/2,0)	Y:(0,1/2,0)	(Z)Y ₁ (1)	(Z)Ÿ ₂ (1)	(Z)Y ₁ (1)	(Z) <mark>₹</mark> 2(1)	(Z)Y ₁ (1)	(Z) <mark>₹</mark> 2(1)	(Z)Y ₁ (1)	(Z)Ÿ ₂ (1)

- Complete strong and fragile eigenvalue indicators
- Physical meaning (new TIs) of all electronic indicators!
 - Y. Xu, L. Elcoro, Z. Song, B. J. Wieder, M. G. Vergniory, N. Regnault, Y. Chen, C. Felser, B. A. Bernevig, arXiv:2003.00012 (2020)
 - L. Elcoro^{*}, B. J. Wieder^{*}, Z. Song^{*}, Y. Xu, N. Regnault, B. Bradlyn, B. A. Bernevig, *To Appear*

Magnetic Material Database With Known Structures From Neutron Scattering

bilbao crystallographic server



- · Crystal and Magnetic structures from experiments.
- (Para)Magnetic symmetries
- Portable mcif files.

https://www.cryst.ehu.es

until Jan. 2020

Crystal & Magnetic structures from mcif files

Example: BCSID-2.5



Calculational methods: New Package 1 Addition to VASP

Ab-initio calculations are performed with VASP Package.

- **GGA-PBE** functional method; Spin-orbital coupling (SOC);
- LDA+U; U=0,1,2,3,4 eV for 3d/4d U=0,2,4,6 eV for 4f/5f
- Initial Magnetic Moments from Neutron-scattering experiments.



Mag-VASP2trace package on BCS (To be available)

Only Unitary symmetries

Unitary and anti-unitary symmetries

 $\vec{k} = \vec{k}R_i^{-1} + n\vec{g}$

 $R_j \in G(k)$

 $<\Psi_{n}(\overrightarrow{k})|R_{i,\overrightarrow{k}}|\Psi_{n}(\overrightarrow{k})>$

• Type-I MSG M = G

Type-II,III,IV MSG M = G + H

- · Identify Little co-group G(k) for each Maximal K-vec.
- From Bloch WF $|\Psi_n(k) >$ to symmetry characters



Calculational methods: New Package 2 Addition to VASP

Check MAGMAT Topo. on BCS (To be available)

•



Topological phase diagrams

Self-consistent calculations of 403 of the 549 materials converge

130 materials, 32%, with topological phases at least at one of the U values:

- 1. 50 most robust topological materials, which maintain the same topology for all U values.
- 2. 49 of them are topological nontrivial at small U but become trivial as U increases.
- 3. 20 materials: non-monotonous dependence on U; nontrivial categories at U = 0, different nontrivial categories at finite U.
- 4. 6 materials are trivial at U = 0, but become topologically nontrivial at some finite U.

Ideal topological materials Axion insulator NpBi/NpSb





MTQC

Minimal subgroup: $P\bar{1}(No.2.4)$ Indice group: $\mathbb{Z}_4 \times \mathbb{Z}_2^3$ $z_4 = \sum_K n_K^- \mod 4$ $z_{2,i=1,2,3} = \sum_{K,K_i=\pi} n_K^- \mod 2$ $(z_4, z_{2,1}, z_{2,2}, z_{2,3}) = (2,0,0,0)$



arXiv:1810.02373 (2018) & Phys.Rev.Lett. 122, 256402 (2019)

Ideal topological materials

Symmetry enforced Semimetals



CeCo2P2: HO-DSM/NLSM

Dirac nodes protected by C4z Nodal-line protected by Mz Higher-order SM with co-point group 4mm



Mn3ZnC: WSM/NLSM w

Weyl nodes protected by C4z Nodal-line protected by Mz



Supervised learning:

- Train the network with a large amount of labeled data (input-output pairs): Reduce a cost function (distance measure between network output and labels) via e.g. gradient descent.
- Verify the network performance on a distinct test data set.



Unsupervised learning:

Use unlabeled data, the network learns to cluster data/find structure/learn probability distribution of features.

Reinforced learning:

Agents, reward : direct the action of software agents in an environment to maximize some cumulative reward (e.g. videogame score).

Machine Learning Discovery Of Topology Without Band Structure Calculation

Our situation

• Input:

- Nbr of electrons: encoded in binary (easy to detect parity effects, like ESFDs in some specific SGs).
- Symmetry group: number + frequencies of each class (fingerprint of each SG)
- Chemical structure: mean number of s,p,d,f valence electrons, number of atoms per column/row in the periodic table (to encode chemical similarity).
- (optional): atom position encoded as average and variance of distances between atoms and their nearest neighbors, coulomb matrix, ...

• Output:

- *Coarse grained label*: Trivial/TI/TSM.
- Full label: Trivial/NLC/SEBR/ES/ESFD.

• Training and testing:

- 32k materials for the training, 2.5k for the testing.
- Cross-validation (to estimate the error).

Model	d	Acc.	F_1 Triv.	F_1 TI	F_1 TSM
		[%]	[%]	[%]	[%]
Full model (FM)	49	89.7(5)	94.0(3)	70(1)	92.0(5)
FM + Non-SOC	50	92.0(3)	96.5(2)	77(1)	93.3(4)
Baseline model	94	86.0(5)	92.5(5)	67(1)	91.0(5)
<i>spdf</i> + model	10	87.7(5)	93.0(5)	69(1)	92.0(5)
FM + nearest-neighbor	184	89.0(5)	94.0(3)	69(3)	92.0(5)
FM without SG	48	84.0(5)	91.5(3)	57(2)	86(1)

- *d*: size of the input vector.
- Full model: SG, N_e, spdf+, number of atoms from each periodic table row and column.
- Baseline model: SG, N_e, baseline descriptor (nbr of atoms from each element in stoichiometric formula).

https://www.topologicalquantumchemistry.com/mltqc

• Topological Materials • Database	
NAVIGATION	Detection of Topological Materials with Machine Learning
About ML	This online tool predicts the topological classification of materials. It is based on gradient boosted trees trained with the ab-initio results from the topological quantum chemistry database. A full description of this method is available in arxiv:1910.10161.
	Provide your material information
	1. Upload your VASP input file (POSCAR) (?) : Browse No file selected.
	2. Or provide the chemical composition of the primitive unit cell ? : use either Bi Te OR Bi2 Te OR Bi2 Te3
	3. Choose your symmetry group: 1 (P1)
	4. Add the topological classification without spin-orbit coupling: Unknown V
	Submit compound
	When using the information on this website in a publication, please cite the following three papers: Topological Quantum Chemistry Nature 298, 547305 (2017) A Complete Catalogue of High-Quality Topological Materials Materials Nature 566, 480-485 (2019) Detection of Topological Materials with Machine Learning arxiv:1910.10161

Many New Directions:

Phonons

Material Structure Through Topology

Catalysis

Interesting Atomic Insulators

Twisted and Engineered Materials

Interactions

MetaMaterials